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APPLICATION FOR LETTERS PATENT

**Computer-Aided Writing System and Method with
Cross-Language Writing Wizard**

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1 **RELATED CASES**

2 The present application is a continuation-in-part of U.S. Patent Application
3 Serial No. _____, filed concurrently herewith on _____, entitled
4 "Language Input User Interface", which is incorporated herein by reference.
5

6 **TECHNICAL FIELD**

7 The present invention relates to a machine-aided writing systems and
8 methods. More particularly, the present invention relates to a language input user
9 interface and underlying architecture that facilitates entry of multiple languages
10 and assists users with entry of non-native languages.
11

12 **BACKGROUND**

13 With the rapid development of the Internet, computer users all over the
14 world are becoming increasingly familiar with writing English. Unfortunately, for
15 some societies that possess significantly different cultures and writing styles, the
16 ability to write in English is an ever-present barrier. This is not due to lack of
17 knowledge, as research suggests that many non-English users have sufficient
18 knowledge of English to easily discriminate between a sentence written in native-
19 English and a sentence written in broken English. English is used an example, but
20 the problem persists across other language boundaries.

21 Consider the plight of a Chinese user. Typically, when a Chinese user
22 wants to write an English word/phrase in which he is unfamiliar with its spelling
23 or usage, the user usually looks up the word/phrase in a Chinese-English
24 dictionary. If the dictionary is an electronic dictionary, the user must input the
25 Chinese word/phrase via some input mechanism. This process suffers three

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1 shortcomings. First, it is not convenient for a Chinese user to input a Chinese
2 word/phrase. Second, forcing the user to enter a Chinese word/phrase interrupts
3 the user's train of thought when writing in English. Third, as a non-native speaker
4 of English, it is difficult for a Chinese user to select a suitable word from the
5 dictionary.

6 Accordingly, there is a need for a machine-aided writing system that helps
7 non-English users with spelling, grammar, and writing as a native-English user.
8 As envisioned by the inventors, such a machine-aided writing system should act as
9 a consultant that provides various kinds of help whenever necessary, and allows
10 the users to control the writing. Such a system might provide spelling help to
11 assist users with hard-to-spell words and simultaneously check the usage in a
12 certain context. The machine-aided writing system might further provide some
13 form of sentence help to let users refine the writing by providing perfect example
14 sentences.

15 Several machine-aided approaches have been proposed. The approaches
16 typically fall into two categories: (1) automatic translation, and (2) translation
17 memory. Both work at the sentence level. The former attempts to automatically
18 translate sentences entered by the user into sentences that are grammatically and
19 stylistically correct. However, the quality of fully automatic machine translation
20 in the current system is not completely satisfactory because a significant amount
21 of manual editing is needed following such translation to ensure the high quality.
22 The translation memory approach works like a case-based system in that, given a
23 sentence, the system retrieves similar sentences from a translation example
24 database. The user then translates the subject sentence by analogy.

1 While both approaches offer some advantages, there remains room to
2 improve the user experience with computer-aided writing systems. More
3 particularly, there is a need for a computer-aided writing system that allows non-
4 English user to collaborate with the computer in a way that achieves the highest
5 quality writing with less brute force effort.

6 7 SUMMARY

8 A computer-aided writing system offers assistance to a user writing in a
9 non-native language, as the user needs help, without requiring the user to divert
10 attention away from the entry task. The writing system provides a user interface
11 (UI) that integrates writing assistance with normal text entry. The writing system
12 provides assistance to users who are having difficulty spelling a non-native word
13 or selecting the appropriate word for a given context. The writing system also
14 provides sample sentence structures to demonstrate how words are used and how
15 sentences are properly crafted.

16 In the described implementation, the writing system is implemented as a
17 writing wizard for a word-processing program. The writing wizard is exposed via
18 a graphical UI that allows the user to enter words in a non-native language. When
19 the user is unsure of a word's spelling or whether the word is appropriate, the user
20 may enter a corresponding native word directly in line with the ongoing sentence.

21 An error tolerant spelling tool accepts the native word (even if it is
22 misspelled or mistyped) and attempts to derive the most probable non-native word
23 for the given context. The spelling tool utilizes a bilingual dictionary to determine
24 possible non-native word translation candidates. These candidates are passed to a
25 non-native language model (e.g., a trigram language model) and a translation

1 model. The non-native language model generates probabilities associated with the
2 candidates given the current sentence or phrase context. The translation model
3 generates probabilities of how likely a native word is intended given the non-
4 native word candidates. From these probabilities, the spelling tool determines the
5 most probable non-native word translation. The writing wizard substitutes the
6 non-native word for the native input string. To the user, the substitution takes
7 place almost immediately after entering the native input string.

8 If the user likes the non-native word, the user may simply continue with the
9 sentence. On the other hand, if the user is still unsure of the non-native word, the
10 user can invoke more assistance from the writing wizard. For instance, the writing
11 wizard has a sentence recommendation tool that allows the user to see the non-
12 native word in a sentence context to learn how the word can be used. A window
13 containing example bilingual sentence pairs is presented to the user so that the
14 user can learn how the non-native word is used in the sentence and see the
15 corresponding sentence written in the native language. In addition, the wizard can
16 present a list of other native word translations of the input string, as well as a list
17 of other non-native word candidates. The user can select any one of these words
18 and review the selected word in a sample pair of bilingual sentences. In this
19 manner, the spelling tool and sentence recommendation tool work together in a
20 unified way to greatly improve the productivity of writing in a non-native
21 language.

22 **BRIEF DESCRIPTION OF THE DRAWINGS**

23 The same numbers are used throughout the Figures to reference like
24 components and features.
25

1 Fig. 1 is a block diagram of a computer system that implements a writing
2 system with a cross-language writing wizard.

3 Fig. 2 is a block diagram of a software architecture of the cross-language
4 writing wizard.

5 Fig. 3 is an illustration of a word-level translation between words in a first
6 language and words in a second language.

7 Fig. 4 is a flow diagram of a process for providing writing assistance to a
8 user who is attempting to write in a non-native language.

9 Fig. 5 is a diagrammatic illustration of a screen display of a user interface
10 for the writing system. Fig. 5 illustrates an in-line input feature of the UI.

11 Fig. 6 is a screen display corresponding to the Fig. 5 display that is adapted
12 for a Chinese-English version of the writing system.

13 Fig. 7 is a diagrammatic illustration of a screen display of the writing
14 system UI that depicts automatic conversion from an input string in a native
15 language (e.g., Pinyin) to a non-native word (e.g., English).

16 Fig. 8 is a screen display corresponding to the Fig. 7 display that is adapted
17 for a Chinese-English version of the writing system.

18 Fig. 9 is a diagrammatic illustration of a screen display of the writing
19 system UI that depicts alternative translations of the input string within the native
20 language (e.g., alternative Chinese words translated from the Pinyin).

21 Fig. 10 is a screen display corresponding to the Fig. 9 display that is
22 adapted for a Chinese-English version of the writing system.

23 Fig. 11 is a diagrammatic illustration of a screen display of the writing
24 system UI that depicts alternative translations of non-native words based on a
25

1 selected native word (e.g., possible English words corresponding to a Chinese
2 word).

3 Fig. 12 is a screen display corresponding to the Fig. 11 display that is
4 adapted for a Chinese-English version of the writing system.

5 Fig. 13 is a diagrammatic illustration of a screen display of the writing
6 system UI that depicts sample bilingual sentences using a selected non-native
7 word.

8 Fig. 14 is a screen display corresponding to the Fig. 13 display that is
9 adapted for a Chinese-English version of the writing system.

10 Fig. 15 is a diagrammatic illustration of a screen display of the writing
11 system UI that depicts sample bilingual sentences invoked directly in response to
12 user entry of native language text.

13 14 **DETAILED DESCRIPTION**

15 A computer-aided writing system helps a user write in a non-native
16 language by offering consultation assistance for spelling and sentence structure.
17 The writing system implements a statistical spelling tool that assists in spelling
18 and a sentence recommendation tool that intelligently recommends example
19 sentences. The tools are exposed through a user interface as an integrated
20 mechanism that highly improves the productivity of writing in a non-native
21 language.

22 The writing system and methods are described as helping non-English users
23 write in English. In particular, one exemplary implementation used throughout
24 this disclosure for illustration purposes is directed to a Chinese user who is writing
25

1 in English. However, the principles and concepts described herein may be readily
2 ported to other languages and users of other nationalities.

3 For discussion purposes, the computer-aided writing system is described in
4 the general context of word processing programs executed by a general-purpose
5 computer. However, the computer-aided writing system may be implemented in
6 many different environments other than word processing (e.g., email systems,
7 browsers, etc.) and may be practiced on many diverse types of devices.

8 9 **System Architecture**

10 Fig. 1 shows an exemplary computer system 100 having a central
11 processing unit (CPU) 102, a memory 104, and an input/output (I/O) interface
12 106. The CPU 102 communicates with the memory 104 and I/O interface 106.
13 The memory 104 is representative of both volatile memory (e.g., RAM) and non-
14 volatile memory (e.g., ROM, hard disk, etc.). Programs, data, files, and may be
15 stored in memory 104 and executed on the CPU 102.

16 The computer system 100 has one or more peripheral devices connected via
17 the I/O interface 106. Exemplary peripheral devices include a mouse 110, a
18 keyboard 112 (e.g., an alphanumeric QWERTY keyboard, a phonetic keyboard,
19 etc.), a display monitor 114, a printer 116, a peripheral storage device 118, and a
20 microphone 120. The computer system may be implemented, for example, as a
21 general-purpose computer. Accordingly, the computer system 100 implements a
22 computer operating system (not shown) that is stored in memory 104 and executed
23 on the CPU 102. The operating system is preferably a multi-tasking operating
24 system that supports a windowing environment. An example of a suitable
25

operating system is a Windows brand operating system from Microsoft Corporation.

It is noted that other computer system configurations may be used, such as hand-held devices, multiprocessor systems, microprocessor-based or programmable consumer electronics, network PCs, minicomputers, mainframe computers, and the like. In addition, although a standalone computer is illustrated in Fig. 1, the language input system may be practiced in distributed computing environments where tasks are performed by remote processing devices that are linked through a communications network (e.g., LAN, Internet, etc.). In a distributed computing environment, program modules may be located in both local and remote memory storage devices.

The computer system 100 implements a writing system that serves two functions: (1) language conversion and (2) assisting writing in non-native languages. The first function is to receive input strings (e.g., phonetic text) and convert the input strings automatically to output strings (e.g., language text). The conversion process is tolerant to spelling and entry errors. The second function is to aid users in writing words and sentences in non-native languages by offering spelling assistance and guidance as to correct sentence structure and style.

The writing system is implemented in Fig. 1 as a data or word processing program 130 stored in memory 104 and executed on CPU 102. The word processing program 130 implements a language input architecture 132 that performs the language conversion and writing assistance. The language input architecture 132 has a conversion system 134 to perform the conversion function and a cross-language wizard 136 to assist the user when entering non-native text. The conversion system 134 and cross-language wizard 136 are exposed via a

1 unified user interface (UI) 138. The word processing program 130 may include
2 other components in addition to the architecture 132, but such components are
3 considered standard to word processing programs and will not be shown or
4 described in detail.

6 Conversion System 134

7 The conversion system 134 converts input strings in one form (e.g.,
8 phonetic text characters) to an output string of another form (e.g., language text
9 characters). It includes a search engine 140, one or more typing models 142, a
10 language model 144, and one or more lexicons 146 for various languages. The
11 architecture 132 is language independent. The UI 138 and search engine 140 are
12 generic and can be used for any language. The architecture 132 is adapted to a
13 particular language by changing the language model 144, the typing model 142
14 and the lexicon 146.

15 The user enters an input string via one or more of the peripheral input
16 devices, such as the mouse 110, keyboard 112, or microphone 120. In this
17 manner, a user is permitted to input phonetic information using keyed entry or oral
18 speech. In the case of oral input, the computer system may further implement a
19 speech recognition module (not shown) to receive the spoken words and convert
20 them to phonetic text. The following discussion assumes that entry of text via
21 keyboard 112 is performed on a full size, standard alphanumeric QWERTY
22 keyboard.

23 The UI 138 displays the input string as it is being entered. The UI 138 is
24 preferably a graphical user interface. A more detailed discussion of the UI 138 is
25 found in the above-referenced U.S. Patent Application Serial No. _____,

1 entitled "Language Input User Interface". As one example, the input string
2 contains phonetic text or a mixture of phonetic and non-phonetic text. "Phonetic
3 text" generally refers to an alphanumeric text representing sounds made when
4 speaking a given language. "Non-phonetic text" is alphanumeric text that does not
5 represent sounds made when speaking a given language. Non-phonetic text might
6 include punctuation, special symbols, and alphanumeric text representative of a
7 written language other than the language text.

8 The conversion system 134 converts the phonetic text to language text. A
9 "language text" is the characters and non-character symbols representative of a
10 written language. Perhaps more generally stated, phonetic text may be any
11 alphanumeric text represented in a Roman-based character set (e.g., English
12 alphabet) that represents sounds made when speaking a given language that, when
13 written, does not employ the Roman-based character set. Language text is the
14 written symbols corresponding to the given language.

15 For discussion purposes, word processor 130 is described in the context of
16 a Chinese-based word processor and the language input architecture 132 is
17 configured to convert Pinyin to Hanzi. That is, the phonetic text is Pinyin and the
18 language text is Hanzi. However, the language input architecture is language
19 independent and may be used for other languages. For example, the phonetic text
20 may be a form of spoken Japanese (hiragana, katakana), whereas the language text
21 is representative of a Japanese written language, such as Kanji. Many other
22 examples exist including, but not limited to, Arabic languages, Korean language,
23 Indian language, other Asian languages, and so forth.

24 The user interface 138 passes the phonetic text (P) to the search engine 140,
25 which in turn passes the phonetic text to the typing model 142. The typing model

1 142 generates various typing candidates (TC_1, \dots, TC_N) that might be suitable
2 edits of the phonetic text intended by the user, given that the phonetic text may
3 include errors. The typing model 142 returns multiple typing candidates with
4 reasonable probabilities to the search engine 140, which passes the typing
5 candidates onto the language model 144. The language model 144 evaluates the
6 typing candidates within the context of the ongoing sentence and generates various
7 conversion candidates (CC_1, \dots, CC_N) written in the language text that might be
8 representative of a converted form of the phonetic text intended by the user. The
9 conversion candidates are associated with the typing candidates.

10 Conversion from phonetic text to language text is not a one-for-one
11 conversion. The same or similar phonetic text might represent a number of
12 characters or symbols in the language text. Thus, the context of the phonetic text
13 is interpreted before conversion to language text. On the other hand, conversion
14 of non-phonetic text will typically be a direct one-to-one conversion wherein the
15 alphanumeric text displayed is the same as the alphanumeric input.

16 The conversion candidates (CC_1, \dots, CC_N) are passed back to the search
17 engine 140, which performs statistical analysis to determine which of the typing
18 and conversion candidates exhibit the highest probability of being intended by the
19 user. Once the probabilities are computed, the search engine 140 selects the
20 candidate with the highest probability and returns the language text of the
21 conversion candidate to the UI 138. The UI 138 then replaces the phonetic text
22 with the language text of the conversion candidate in the same line of the display.
23 Meanwhile, newly entered phonetic text continues to be displayed in the line
24 ahead of the newly inserted language text.
25

1 If the user wishes to change language text from the one selected by the
2 search engine 140, the user interface 138 presents a first list of other high
3 probability candidates ranked in order of the likelihood that the choice is actually
4 the intended answer. If the user is still dissatisfied with the possible candidates,
5 the UI 138 presents a second list that offers all possible choices. The second list
6 may be ranked in terms of probability or other metric (e.g., stroke count or
7 complexity in Chinese characters).

8 9 Cross-Language Wizard 136

10 The word processing program 130 may alternatively, or additionally, be
11 used to write primarily in a non-native language. The cross-language writing
12 wizard 136 lends the support needed to write effectively in the non-native
13 language. The user enters the non-native language via UI 138. When the user is
14 unsure how to write a word or phrase, the user may enter the word in his/her
15 native language. The writing wizard 136 recognizes the different language input
16 and offers effective help without diverting the user's attention from the entry task.
17 The wizard provides spelling assistance and recommends sentence structures and
18 styles as a way to improve the user's writing.

19 Suppose, for example, a Chinese user wants to write text in English. The
20 user writes an English sentence in an entry area presented by the UI 138. When
21 the user is unsure how to express a thought in English, the user may decide to
22 write in familiar Chinese Pinyin. The writing wizard 136 recognizes the Pinyin
23 input, and translates the Pinyin into the most suitable English word immediately.
24 The correlative Chinese word will be shown beside the English word for the user's
25 reference. If the user thinks the English word is not quite right, the user may

request other English words related to the Chinese Pinyin. If the user is not sure which English word is best in this context, the user may browse Chinese-English bilingual sentence examples in which the Chinese word and the English word are presented together. The context information helps the user decide which word is the best fit for the present context. In addition, the user can input a Chinese sentence pattern directly, and select an appropriate English sentence type by browsing bilingual sentence examples.

Exemplary Writing Wizard Architecture

Fig. 2 illustrates an exemplary writing wizard architecture 200 that integrates the user interface 138 and the writing wizard 136. The writing wizard architecture 200 allows a user to enter characters in one or more languages via the UI 138 and offers help when the user needs it without diverting the user's attention away from the entry area.

The writing wizard 200 has a spelling tool 202 to provide spelling assistance on the word or phrase level and a sentence recommendation tool 204 to offer helpful suggestions regarding sentence structure. The tools 202 and 204 work together to provide assistance as needed by the user. Again, for discussion purposes, the tools are described in the context of a Chinese user writing in English. However, the tools may be implemented in any combination of languages.

Spelling Tool 202

The spelling tool 202 performs two primary functions. The first function is to offer a synonym or antonym associated with the English word entered by the

1 user. The spelling tool accesses an English thesaurus 210 to retrieve the synonym
2 or antonym of the English word.

3 The second function of spelling tool 202 is translate a native word entered
4 by the user to a non-native word. The spelling tool provides a translator 212 that
5 automatically converts an entered string to a native word familiar to the user. For
6 instance, a Chinese user may input a Pinyin string and the translator 212 converts
7 the Pinyin to a Chinese word in Hanzi characters. The translator 212 may be
8 implemented to include a polyphone model that expands Pinyin possibilities for a
9 Chinese word (e.g., Chinese word '乐' has two pinyin sets "le" and "yue"), a fault
10 tolerance model that accepts misspellings and entry errors, and a simplified Pinyin
11 model (e.g., allows user to input "hj" for "huanjing").

12 Following the initial form conversion, the translator 212 then translates the
13 native word to a suitable non-native word that may be used in the ongoing
14 sentence. In the illustrated implementation involving a Chinese-English writing
15 system, the translator 212 uses three models to provide the translation: (1) an
16 English language model 214, (2) a Chinese-English bilingual dictionary 216, and
17 (3) an English-Chinese translation model 218.

18 The Chinese English bilingual dictionary 216 contains Chinese words and
19 their corresponding English translations to provide possible English word
20 translation candidates for the Chinese word. As an example, the dictionary 216
21 might include approximately 115,000 Chinese words and corresponding English
22 translations. The dictionary 216 may also include other information, such as part-
23 of-speech, semantic classification, and so forth.

24 The English language model 214 generates probabilities associated with the
25 English word candidates given the current sentence or phrase context. In one

implementation, the English language model 214 is a statistical N-gram model, such as the N-gram Markov model, which is described in “Statistical Methods for Speech Recognition”, by Frederick Jelinek, The MIT Press, Cambridge, Massachusetts, 1997. As one suitable example, the English language model 214 can be constructed as a tri-gram model (i.e., $N=3$) that employs approximately 240,000,000 tri-grams and a vocabulary with 58,000 words.

The English-Chinese translation model 218 generates probabilities of how likely a Chinese word is intended given each of the English word candidates. In one implementation, the English-Chinese translation model 218 is a statistical model that is trained from a word-aligned bilingual corpus, which may be derived from corpus 224 (described below). The translation model 218 may be a trigram model if the training bilingual corpus is sufficiently large; otherwise, a bigram or unigram translation model may be used. Chinese sentences are segmented before word translation training because written Chinese consists of a character stream without spaces between words. Prior to training, a wordlist is used in conjunction with an optimization procedure to segment the sentences. One example of a suitable optimization procedure is described in an article written by Jianfeng Gao, Han-Feng Wang, Mingjing Li, and Kai-Fu Lee, entitled “A unified approach to statistical language modeling for Chinese”, *IEEE, ICASPP2000*, 2000.

After segmentation, the bilingual training process trains on the words. One suitable process is based on an iterative EM (expectation-maximization) procedure for maximizing the likelihood of generating an English word given a Chinese character or word. The output of the training process is a set of potential English translations for each Chinese word, together with the probability estimate for each translation. One suitable EM procedure is described in an article by Brown, P.F.,

Jennifer C. Lai, and R.L. Merce, entitled "Aligning sentences in parallel corpora",
In *Proceedings of the 29th Annual Conference of the Association for
Computational Linguistics*, 169-176, Berkeley, 1991.

The translator 212 uses the probabilities returned from the English language
model 214 and the English-Chinese translation model 218 to determine the
English word candidate with the highest probability of being the word intended by
the user given the Pinyin string within the sentence context. The writing wizard
136 passes the optimal word back to the UI 138, which substitutes the English
word for the Chinese Pinyin input string. To the user, the English word is almost
immediately substituted after the Pinyin string is entered.

To further demonstrate the spelling tool 204, suppose that a Chinese user
inputs two English words EW_1 and EW_2 and then becomes unsure of how to spell
or phrase the next word in English. The Chinese user enters a Pinyin string PY
that expresses the user's intention. The spelling tool 202 passes the string PY to
the translator 212, which looks up all candidate Chinese words from a Pinyin-
Chinese dictionary.

Fig. 3 shows the word-level Pinyin-English translation 300. The first row
302 shows the user-entered English words EW_1 and EW_2 and Pinyin PY . In the
second row 304, the Pinyin string is translated to multiple Chinese words CW_1 ,
 CW_2 , ..., CW_m . The translator 212 then obtains a list of candidate English
translations from the Chinese English bilingual dictionary 216 for each of the
Chinese words CW_1 , CW_2 , ..., CW_m . The third row 306 shows the English words
 EW_{11} , ..., EW_{1n} for the first Chinese word CW_1 and English words EW_{m1} , ..., EW_{mq}
for the last Chinese word CW_m .

The candidate English words in row 306 are initially returned in their original or root form and may not fit the context of the sentence. The translation model expands each word to other morphological forms. For instance, the root “go” is expanded to inflections such as “went”, “goes”, “going”, and “gone”.

From the candidate list, the translator 212 attempts to select the best English word in this specified contextual condition and present that word to the user. The translator compares the probabilities of all English words in row 306 of Fig. 3 and selects the English word with the highest probability as the most proper translation of the Pinyin input string *PY*. This can be expressed statistically as the probability that English word candidate EW_{ij} was intended by the user given the actual entry of *PY*, EW_1 , and EW_2 , which is written as follows:

$$\arg \max_{EW_{ij}} P(EW_{ij} | EW_1, EW_2, PY)$$

According to Bayes law, the conditional probability is estimated as follows:

$$P(EW_{ij} | EW_1, EW_2, PY) = \frac{P(PY | EW_1, EW_2, EW_{ij}) \times P(EW_{ij} | EW_1, EW_2)}{P(PY | EW_1, EW_2)} \quad (1)$$

Since the denominator is independent of EW_{ij} and the same for all situations, the denominator may be omitted, leaving the following relationship:

$$P(EW_{ij} | PY, EW_1, EW_2) \propto P(PY | EW_{ij}, EW_1, EW_2) \times P(EW_{ij} | EW_1, EW_2) \quad (2)$$

Introducing a Chinese word CW_i into the term, $P(PY | EW_{ij}, EW_1, EW_2)$, yields the following:

$$P(PY | EW_1, EW_2, EW_{ij}) = \frac{P(CW_i | EW_1, EW_2, EW_{ij}) \times P(PY | CW_i, EW_1, EW_2, EW_{ij})}{P(CW_i | PY, EW_1, EW_2, EW_{ij})} \quad (3)$$

For simplicity, the following assumptions are made:

$$P(CW_i | EW_1, EW_2, EW_{ij}) \approx P(CW_i | EW_{ij})$$

$$P(PY | CW_i, EW_1, EW_2, EW_{ij}) \approx P(PY | CW_i)$$

$$P(CW_i | PY, EW_1, EW_2, EW_{ij}) \approx 1$$

The assumptions permit an approximation of formula (3) as follows:

$$P(PY | EW_1, EW_2, EW_{ij}) = P(CW_i | EW_{ij}) \times P(PY | CW_i) \quad (4)$$

Combining formulas (2) and (4) provides:

$$P(EW_{ij} | PY, EW_1, EW_2) = P(CW_i | EW_{ij}) \times P(PY | CW_i) \times P(EW_{ij} | EW_1, EW_2) \quad (5)$$

1 where the term $P(CW_i | EW_{ij})$ is the English-Chinese translation model 218, the
2 term $P(PY | CW_i)$ is a polyphone model, which is set to 1, and the term $P(EW_{ij} |$
3 $EW_1, EW_2)$ is the English tri-gram language model 214.

4 Accordingly, the original goal for the spelling tool may be restated as
5 finding the most probable translation of the Pinyin string PY by retrieving the
6 English word with the highest conditional probability.

$$\arg \max_{EW_{ij}} P(EW_{ij} | EW_1, EW_2, PY) \approx \arg \max_{EW_{ij}} P(CW_i | EW_{ij}) \times P(EW_{ij} | EW_1, EW_2)$$

9 10 Sentence Recommendation Tool 204

11 The sentence recommendation tool 204 operates at the sentence level to
12 suggest possible sentences to assist the user in writing phrases and sentences
13 correctly in a non-native language. When the user needs assistance, the user
14 enters via UI 138 a sequence of keywords or a short phrase that attempts to convey
15 the essence of the intended sentence. The sentence recommendation tool 204
16 employs a query expansion 220 to expand the query to relevant alternative
17 expressions. The sentence recommendation tool 204 passes the expanded query to
18 a sentence retrieval algorithm 222, which searches a large bilingual corpus 224.
19 The sentence retrieval algorithm 222 returns one or more pairs of bilingual
20 sentences expressing meanings relevant to the user's query or having syntactical
21 relevance. The sentence pairs include the sentence written in the native language
22 and the corresponding sentence properly written in the non-native language.

23 The bilingual corpus 224 may be constructed in many ways. One approach
24 is to collect sentence pairs from various online and offline sources, such as World
25 Wide Web bilingual sites, dictionaries, books, bilingual news and magazines, and

product manuals. As one example, the size of the bilingual corpus constructed by the inventors contains 96,362 sentence pairs. In the Fig. 2 architecture, the corpus 224 is used for the following three tasks:

- (1) Act as translation memory to support the sentence recommendation tool 204.
- (2) Support English-Chinese translation model 218 at word and phrase level.
- (3) Extract bilingual terms to enrich the Chinese-English bilingual dictionary 216.

To construct a sentence-aligned bilingual corpus, an alignment algorithm automatically aligns sentences in the corpus and the results are corrected manually. Various alignment algorithms may be used, such as lexically based techniques and statistical techniques. Lexically based techniques use extensive online bilingual lexicons to match sentences, whereas statistical techniques require almost no prior knowledge and are based solely on the lengths of sentences.

One unique approach to constructing a sentence-aligned bilingual corpus is to incorporate both lexically based and statistical techniques. The statistical technique is first used to obtain a preliminary result. Then, anchors are identified in the text to reduce complexity. An anchor is defined as a block that consists of n successive sentences. Experiments indicate that best performance is achieved when $n=3$. Finally, a small, restricted set of lexical cues is applied to the anchors for further improvement.

Once the sentence-aligned bilingual corpus 224 is constructed, it may be used to enrich the Chinese-English bilingual dictionary 216. Two steps are made to extract bilingual terms from the sentence-aligned corpus 224. First, Chinese monolingual terms are extracted from the Chinese portion of the corpus 224. One method for this extraction is in an article by Lee-Feng Chien, entitled "PAT-tree-based adaptive key phrase extraction for intelligent Chinese information retrieval", special issue on "*Information Retrieval with Asian Language*", *Information Processing and Management*, 1998. Second, the corresponding English words are extracted from the English portion of the corpus 224 with word alignment information. The result is a candidate list of the Chinese-English bilingual terms. The list is evaluated and terms can be manually added to the bilingual dictionary 216.

To demonstrate the sentence recommendation tool 204, suppose a user inputs a sequence of Chinese characters. The character string is initially segmented into one or more words. The segmented word string acts as the user query that is passed to the query expansion 220. Morphologically modified words or other expanded word forms are returned from the query expansion 220 to the sentence recommendation tool 204.

Suppose that a user query is of the form multiple Chinese words CW_1 , CW_2 , ..., CW_m . All synonyms for each word of the queries are listed based on a Chinese thesaurus (not shown, but included as part of the query expansion component 220), as shown below.

$$\begin{array}{cccc}
 CW_{11} & CW_{21} & \cdots & CW_{m1} \\
 CW_{12} & CW_{22} & \cdots & CW_{m2} \\
 \cdots & \cdots & \cdots & \cdots \\
 CW_{1n_1} & CW_{2n_2} & \cdots & CW_{mn_m}
 \end{array}$$

The query expansion 220 expands the query by substituting a word in the query with its synonym. To avoid over-generation, one implementation parameter is to restrict substitution to one word at each time.

As an example, suppose the query is “声音 效果”. The synonyms list is as follows:

声音 => 声, 音, 音响, 声响, 响声, 超声波,

效果 => 作用, 功效, 实效.....

The query consists of two words. Substituting the first word results in expanded queries, such as “声 效果”, “音 效果”, “音响 效果”, etc. Substituting the second word yields expanded queries, such as “声音 作用”, “声音 功效”, “声音 实效”, etc.

The sentence recommendation tool 204 selects an expanded query for use in retrieving example sentence pairs. One approach to selecting an appropriate query is to estimate the mutual information of words with the query as follows:

$$\arg \max_{i,j} \sum_{\substack{k=1 \\ k \neq i}}^m MI(CW_k, CW_{ij}) \quad (6)$$

Where CW_k is the k -th Chinese word in the query, and CW_{ij} is the j -th synonym of the i -th Chinese word. In the above example, “音响 效果” is selected. The selection, though statistically derived, is a reasonable choice in this instance.

The tool 204 passes the selected query to the sentence retrieval algorithm 222 to retrieve one or more pairs of bilingual sentences containing “音响 效果”. All the retrieved sentence pairs are ranked based on a scoring strategy.

One implementation of a ranking algorithm will now be described. The input of the ranking algorithm is a query Q , which is a Chinese word string, as shown below:

$$Q = T_1, T_2, T_3, \dots T_k$$

The output is a set of relevant bilingual example sentence pairs in the form of:

$$S = \{(C\text{-}Sent, E\text{-}Sent) \mid Relevance(Q, C\text{-}Sent) > \delta \text{ or } Relevance(Q, E\text{-}Sent) > \delta\}$$

where $C\text{-}Sent$ is a Chinese sentence, and $E\text{-}Sent$ is an English sentence in a bilingual sentence pair, and δ is a threshold.

For each sentence, the relevance score is computed in two parts: (1) a *bonus* that represents the similarity of the input query and the target sentence, and (2) a *penalty* that represents the dissimilarity of the input query and the target sentence.

The bonus is computed by the following formula:

$$Bonus_i = \sum_{j=1}^m \log(W_j \times tf_{ij}) \times \log(n/df_j) / L_i$$

where W_j is the weight of the j th word in query Q (described below), tf_{ij} is the number of times the j th word occurs in sentence i , n is the number of sentences in the corpus, df_j is the number of sentences that contain W_j , and L_i is the number of words in the i th sentence.

The above formula considers algebraic similarities. To account for geometric similarities, a penalty formula is used to derive an editing distance as a representation of geometric similarity.

Suppose the matched word list between query Q and a sentence are:

$$R_i = Bonus_i - Penalty_i$$

represented as A and B , respectively,

$$A_1, A_2, A_3, \dots A_m$$

$$B_1, B_2, B_3, \dots B_n$$

The editing distance is defined as the number of editing operations to convert B to A . The penalty increases for each editing operation, but the score is different for different parts of speech. For example, the penalty is greater for verbs than nouns.

$$Penalty_i = \sum_{j=1}^h \log(W_j' \times E_j) \times \log(n/df_j) / L_i$$

where W_j' is the penalty of the j th word and E_j is the editing distance. The score and penalty for each kind of part-of-speech is defined in Table 1.

Table 1

<u>Part of Speech</u>	<u>Score</u>	<u>Penalty</u>
Noun	6	6
Verb	10	10
Adjective	8	8
Adverb	8	8
Preposition	8	8
Conjunction	4	4
Digit	4	4
Digit-classifier	4	4
Classifier	4	4
Exclamation	4	4
Pronoun	4	4
Auxiliary	6	6
Post-reposition	6	6
Idioms	6	6

The highest-ranking sentence pair is returned to the sentence recommendation tool 204 and suggested to the user via the UI 138. The user may then be better informed as to how the sentence should be constructed.

General Operation

Fig. 4 shows a general process 400 for assisting a user write non-native words, phrases, and sentences. The process is preferably implemented in software

1 by the writing system, and particularly, the UI 138 and cross-language writing
2 wizard 136. Accordingly, the process 400 may be implemented as computer-
3 executable instructions that, when executed on a processing system such as CPU
4 102, performs the operations and task illustrated as blocks in Fig. 4. In keeping
5 with the ongoing example implementation, the process is illustrated as pertaining
6 to the Chinese-English writing environment, where English is the non-native
7 language and Chinese is the native language. However, the process may be
8 implemented in other languages.

9 At block 402, the UI 138 receives a user-entered string consisting of
10 English and Pinyin characters. If the characters form an English word (i.e., the
11 "yes" branch from block 404), the writing wizard offers little help because it
12 assumes that the user is not experiencing any trouble writing and spelling English
13 words. Conversely, when the user is unsure how to spell an English word or
14 which English word to use, user can enter a Pinyin string. When Pinyin is
15 received (i.e., the "no" branch from block 404), the spelling tool 200 receives the
16 Pinyin and passes it to the Chinese Word/Pinyin translator 212.

17 At block 406, the translator 212 translates the Pinyin string to one or more
18 Chinese words (e.g., Hanzi characters). The translator 212 selects the most likely
19 Chinese word translation based on statistical probabilities learned previously from
20 a training corpus. The translator 212 is also tolerant to errors entered by the user
21 due to mistyping or misspelling.

22 At block 408, the translator 212 consults the Chinese-English dictionary
23 216 to determine possible English word translation candidates. At block 410, the
24 translator 212 uses the English language model 214 to generate probabilities
25 associated with the different English word candidates given the current sentence or

1 phrase context. In one implementation, the English language model 214 generates
2 probabilities $P(EW_{ij} | EW_1, EW_2)$, which are associated with the different English
3 word candidates EW_{ij} given the previous two words EW_1 and EW_2 . At block 412,
4 the translator 212 consults the English-Chinese translation model 218 to generate
5 probabilities of how likely a Chinese word is intended given each of the English
6 word candidates. For instance, the English-Chinese translation model 218
7 produces probabilities $P(CW_i | EW_{ij})$, identifying how likely a Chinese word CW_i is
8 intended given the various English word candidates EW_{ij} .

9 At block 414, the translator 212 uses the probabilities returned from the
10 English language model and the English-Chinese translation model to determine
11 the English word candidate with the highest probability of being the word intended
12 by the user given the Pinyin string within the sentence context. The writing
13 wizard 136 passes the optimal word back to the UI 138, which substitutes the
14 English word for the Chinese Pinyin input string (block 416). To the user, the
15 English word is essentially immediately substituted for the Pinyin string. The
16 probability calculations are made at processing speeds that is negligible to the
17 user.

18 If the user likes the English word (i.e., the “yes” branch from block 418),
19 the user may simply continue writing more English words or Pinyin strings. On
20 the other hand, if the user is still unsure of the English word, the user can invoke
21 more assistance from the writing wizard via some predefined input, such as
22 pressing the “ESC” key (i.e., the “no” branch from block 418).

23 In response to this user action, the writing wizard allows the user to see the
24 English word in a sentence context to learn how the word can be used (block 420).
25 The user can invoke a window with example bilingual sentence pairs extracted

1 from the bilingual corpus 224 that contain the English word. In addition, the
2 wizard presents a list of other Chinese word translations of the Pinyin string, as
3 well as a list of other English word candidates. The user can select any one of
4 these words and review the selected word in an example pair of bilingual
5 sentences.

6 7 Writing Wizard User Interface

8 The remaining discussion is directed to features of the user interface 138
9 when presenting the writing wizard. In particular, the writing wizard user
10 interface 138 allows user entry of bilingual words from a non-native language and
11 a native language within the same entry line on the screen. Many of the features
12 are described in the context of how they visually appear on a display screen. It is
13 noted that such features are supported by the user interface 138 alone or in
14 conjunction with an operating system.

15 Figs. 5-15 show exemplary writing wizard user interfaces implemented as
16 graphical UIs (GUIs) that are presented to the user as part of a word processing
17 program or other computer-aided writing system. Odd Figs. 5, 7, 9, 11, and 13
18 present a generic graphical user interface (GUI) to illustrate various features of the
19 writing wizard user interface. Even Figs. 6, 8, 10, 12, and 14 present a specific
20 GUI for a Chinese-English machine writing system that corresponds to the generic
21 user interface of Figs. 5, 7, 9, 11, and 13.

22 Fig. 5 shows a screen display 500 presented by the language input UI 138
23 alone, or in conjunction with an operating system. In this illustration, the screen
24 display 500 resembles a customary graphical window, such as those generated by
25 Microsoft's Windows-brand operating system. The graphical window is adapted

for use in the context of language input, and presents an in-line input area 502 in which non-native and native words may be entered by the user. The in-line area 502 is represented pictorially by the parallel dashed lines. An input cursor (not shown) may be used to mark the present position of data entry.

The graphical UI may further include a plurality of tool bars, such as tool bars 504 and 508, or other functional features depending on the application (e.g., word processor, data processor, spread sheet, internet browser, email, operating system, etc.). Tool bars are generally known in the word or data processing art and will not be described in detail.

In Fig. 5, the user has entered two non-native words EW_1 and EW_2 . For discussion purpose, symbol “ EW ” is used throughout the odd figures to represent a non-native word, such as an English Word, that has been input and displayed in the UI. When the user is uncertain how to spell the next non-native word, the user simply enters the corresponding word in his/her native language. In this example, the Chinese user enters Chinese Pinyin character PY at position 510 in the same entry area 502. The Chinese user enters Pinyin rather than Chinese words (e.g., Hanzi characters) because Pinyin can be conveniently entered using a standard QWERTY keyboard or voice recognition system. Pinyin is an example of phonetic text and Hanzi is an example of language text.

Fig. 6 shows an example GUI 600 that corresponds to Fig. 5. The GUI 600 shows two English words 602 (e.g., “I have”) followed by a Pinyin string 604 (e.g., “wancheng”).

After entering the native word (e.g., Pinyin) and pressing the “SPACE” key (or some other actuation), the cross-language wizard 136 automatically recognizes that the current input is a native word and not a non-native word. The spelling

1 tool 202 converts the native word to a corresponding non-native word. If the
2 native word is slightly misspelled or entered incorrectly, the spelling tool tolerates
3 the errors and returns the most probable non-native word. The non-native word is
4 then depicted in the in-line entry area 502 in place of the native word.

5 Fig. 7 shows a screen display 700 presented by the language input UI 138
6 after the native word (e.g., *PY*) is converted to, and replaced with, a corresponding
7 non-native word *EW₃*. For each native input string, there may be more than one
8 possible interpretation in the native language. The writing wizard uses the
9 statistical approach described above to determine the most likely translation. As a
10 result, the input string is first translated to corresponding words in the native
11 language, and then the most probable native word is selected for subsequent
12 translation into non-native words.

13 The most likely native word, represented as *CW₁*, is shown beneath the
14 converted non-native word *EW₃* in a pop-up box 702. The user can view the
15 native word box 702 to determine whether the translation is the one he/she
16 intended.

17 Fig. 8 shows an example GUI 800 that corresponds to Fig. 7. The GUI 800
18 shows the two English words "I have" followed by a third English word
19 "accomplished", which is translated from the Pinyin input string "wancheng" (Fig.
20 6). Beneath the translated word "accomplished" is a pop-up box 702 with the
21 Chinese word "完成".

22 In Chinese, the mapping from Pinyin to Chinese words is one-to-many,
23 meaning that one Pinyin string may be translated to many different Chinese words.
24 In addition, one Chinese word maps to many different English words. The pop-up
25 box 702 contains the most probable Chinese Hanzi word from which the Pinyin

1 was initially translated. This Chinese word was then translated to the English
2 word “accomplished”.

3 If the user agrees with the English word, the user simply continues entering
4 English words within the in-line entry area. On the other hand, if the user is not
5 satisfied with the English word, the writing wizard 136 allows the user to change
6 the selection via some user input, such as pressing the “ESC” key.

7 Fig. 9 shows a screen display 900 presented by the language input UI 138
8 in response to the user pressing the “ESC” key (or some other cue) to change the
9 selection. The writing wizard 136 restores the native input string *PY* at location
10 902, thereby replacing the automatically selected non-native word *EW₃* (Fig. 7).

11 The pop-up box 702 is expanded to include other possible translation of the
12 input string, as represented by *CW₁* and *CW₂*. The most probable word *CW₁* is
13 positioned at the top and initially highlighted to indicate that it is statistically the
14 most likely translation. The second most likely word *CW₂* is listed beneath the
15 most probable word. The user can select any one of the possible translations using
16 conventional focus-and-select techniques (e.g., scrolling and entering, point-and-
17 click, arrow and space keys, etc.).

18 Fig. 10 shows an example GUI 1000 that corresponds to Fig. 9. The GUI
19 1000 shows the Pinyin input string “wancheng” restored in place of the English
20 word “accomplished”. Beneath the Pinyin input string “wancheng” is the pop-up
21 box 702 with two Chinese words.

22 Fig. 11 shows a screen display 1100 presented by the language input UI
23 138 in response to the user selecting the first-listed native word *CW₁*. The native
24 word *CW₁* replaces the input string *PY* at location 1102. A second pop-up box
25 1104 is also presented that contains one or more possible non-native translations

EW₃, EW₄, EW₅, and EW₆ from the native word CW₁. The top-listed candidate, EW₃, is highlighted or otherwise identified in the box 1104. This candidate may initially be the most likely candidate. The user may browse the box 1104 to select a more desired non-native translation using standard navigation techniques (e.g., point-and-click, arrows and space/return keys, etc.).

Fig. 12 shows an example GUI 1200 that corresponds to Fig. 11. The GUI 1200 shows the Chinese word “完成” substituted for the Pinyin input string “wancheng”. Beneath the Chinese word is the pop-up box 1104 with five alternative English words. More or less words may be presented within the box 1104. The user can scroll the box 1104 using conventional navigation tools, such as up/down arrow keys and a scroll bar.

If the user is still unsure of the correct English word, the user can invoke further assistance from the writing wizard by requesting a sample sentence that uses the English word. The user moves the focus to a desired word in the pop-up English word box 1104 and presses a keyboard key (e.g., the right arrow key) to invoke a window that contains a sample sentence.

Fig. 13 shows a screen display 1300 presented by the language input UI 138 in response to the user placing the focus on the non-native word EW₃ in box 1104 and invoking a sample sentence window 1302. The window 1302 presents a bilingual sentence pair that contains a sentence written in native words CW₃, CW₄,...CW_N and a corresponding sentence written in non-native words EW₈, EW₉, ... EW_M. The native word CW₁ and the corresponding non-native word EW₃ that is the subject of the bilingual sentence sample are highlighted or otherwise identified (e.g., italics, bold, etc.). The bilingual sample sentences help the user better understand how the non-native word is used in a particular context.

Fig. 14 shows an example GUI 1400 that corresponds to Fig. 13. The GUI 1400 shows the pop-up box 1104 and a sample sentence window 1302 that uses the English word “completed” in a sentence. In this example, the English sentence reads “If there had not be a hard layer of rock beneath the soil, they would have *completed* the job in a few hours.” The corresponding Chinese sentence written in Hanzi text is presented above the English sentence.

After the user better understands the English word, and how it can be used in a sentence, the user can confirm entry of a suitable English word. Upon confirmation, the English word is substituted for the Chinese word following the two English words. The UI will then present only the three English words “I have completed”, and the two pop-up windows 1104 and 1302 will be removed.

Sentence Assistance

The user may want help on how to construct a sentence properly. The writing wizard allows the user to enter a phrase or sentence directly. For instance, suppose the user enters the following Chinese phrase (either directly or via Pinyin input converted to Chinese words):

提供机会|

The user can then invoke the sample bilingual sentence window 1302 directly by pressing the “ESC” key, or by some other means.

Fig. 15 shows a screen display 1500 presented by the language input UI 138 in response to the user entering the Chinese phrase and directly invoking the sentence window 1302. A corresponding pair of sentences—one in Chinese and

one in English—that utilizes the Chinese phrase and English equivalence is presented in the window 1302. The subject phrases are highlighted or otherwise identified in the sentences.

Conclusion

Although the description above uses language that is specific to structural features and/or methodological acts, it is to be understood that the invention defined in the appended claims is not limited to the specific features or acts described. Rather, the specific features and acts are disclosed as exemplary forms of implementing the invention.